Overview Of The ICH E9(R1) Addendum & The Estimand Framework

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Outline

- Illustrative example
- The estimand framework
- Considerations for intercurrent event strategies
- Impact on trial design, conduct and analysis
- Further examples

Acknowledgments

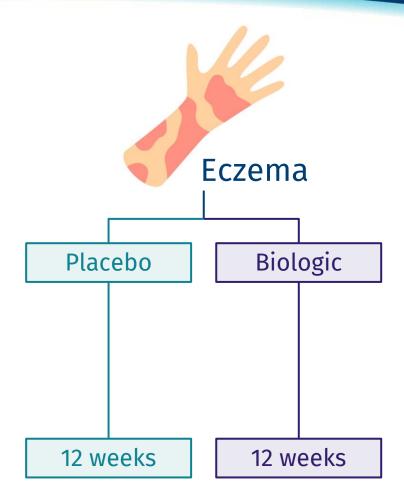
- Some slides include adapted training material available by ICH
- The views expressed are those of the presenters and should not be understood or quoted as being made on behalf of the International Conference on Harmonisation (ICH) or reflecting the position of the ICH or the author's affiliated institutions/companies.

Example: Testing a new biologic in eczema

Objective:

To compare a 12-week course of a new biologic against placebo in routine practice

Primary endpoint: EASI at 12 weeks



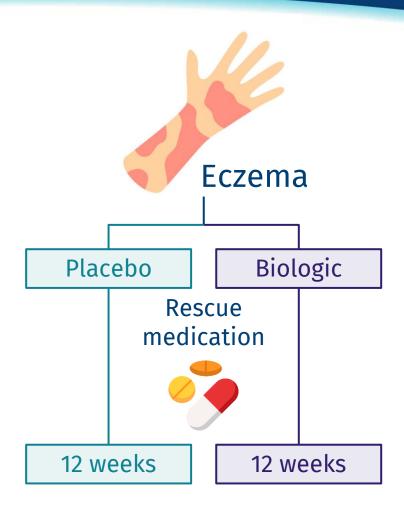
Example: Testing a new biologic in eczema

Objective:

To compare a 12-week course of a new biologic against placebo in routine practice

Primary endpoint: EASI at 12 weeks

 Rescue medication available if needed (available in routine practise)

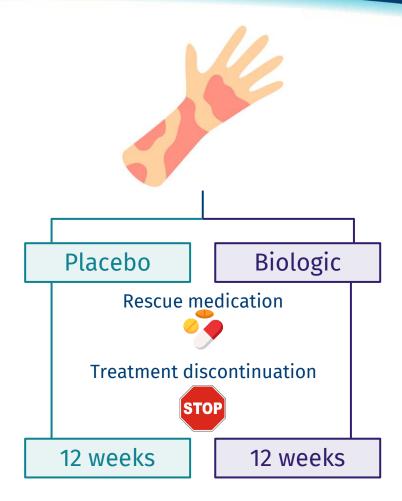


What exactly do we want to find out?

 If we specify "the treatment difference between the biologic and placebo on eczema severity at Week 12" there is ambiguity.

Rescue medication use will affect the interpretation of outcomes

As will early treatment discontinuation



Purpose of ICH E9 (R1) & estimand framework

- Highlights and addresses issues surrounding such ambiguity:
 - Recognition that the treatment effect is not always precisely defined
 - Lack of transparency as to how intercurrent events handled
 - Historically the data collection and analysis methods would inform which treatment effect is being estimated
 - Shift in view: the estimand of interest should inform the data collection and analysis approach

ICH E9 (R1) addendum



INTERNATIONAL COUNCIL FOR HARMONISATION OF TECHNICAL REQUIREMENTS FOR PHARMACEUTICALS FOR HUMAN USE

ICH HARMONISED GUIDELINE

ADDENDUM ON ESTIMANDS AND SENSITIVITY
ANALYSIS IN CLINICAL TRIALS
TO THE GUIDELINE ON STATISTICAL PRINCIPLES FOR
CLINICAL TRIALS

E9(R1)

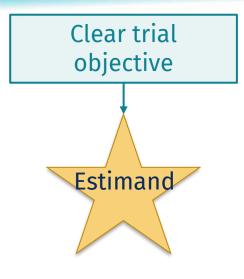
Final version

Adopted on 20 November 2019

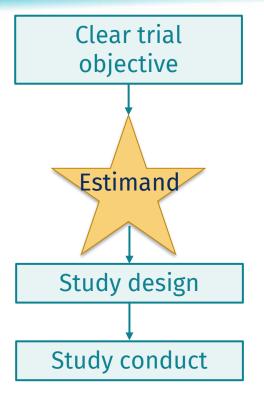
 Applicable whenever treatment effects are to be estimated and tested:

- all phases of clinical development
- clinical trials and observational studies
- regardless of therapeutic area

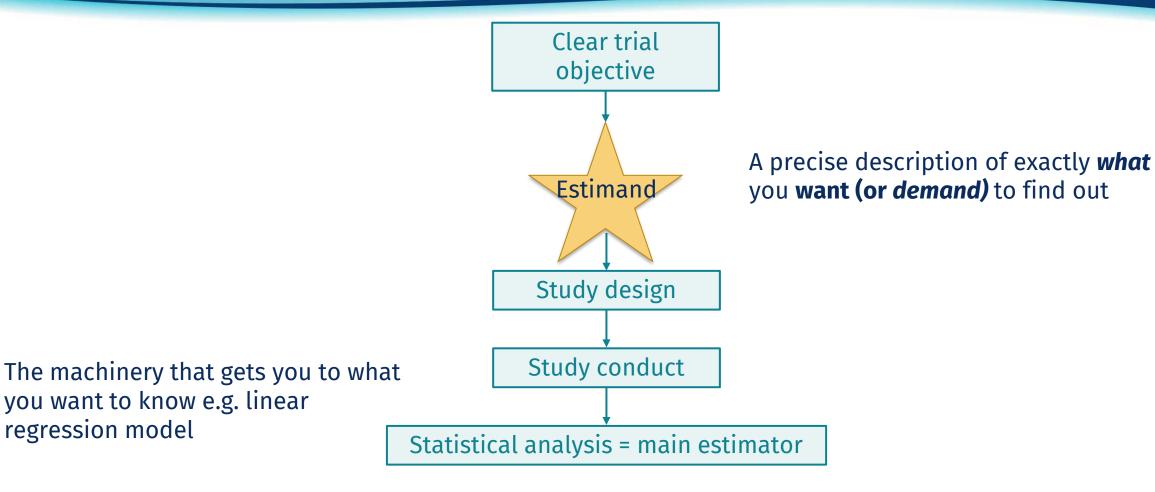




A precise description of exactly **what** you **want (or demand)** to find out



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you want to know e.g. linear

regression model

Clear trial objective A precise description of exactly **what** Estimand you want (or demand) to find out Study design Study conduct The machinery that gets you to what Statistical analysis = main estimator What you want to know e.g. = 7 EASI points Numerical result = main estimate

you want to know e.g. linear

regression model





Recipe

Ingredients

150g unsalted butter, plus extra for greasing

150g plain chocolate, broken into pieces

150g plain flour

1/2 tsp baking powder

1/2 tsp bicarbonate of soda

200g light muscovado sugar

2 large eggs

Method

1. Heat the oven to 160C/140C fan/gas 3. Grease and base line a 1 litre heatproof glass pudding basin and a 450g loaf tin with baking parchment.

2. Put the butter and chocolate into a saucepan and melt over a low heat, stirring. When the chocolate has all melted remove from the heat.



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Ingredients

extra for greasing

broken into pieces

150g plain flour 1/2 tsp baking powder

sugar

2 large eggs

150g plain chocolate,

1/2 tsp bicarbonate of soda

200g light muscovado

150g unsalted butter, plus

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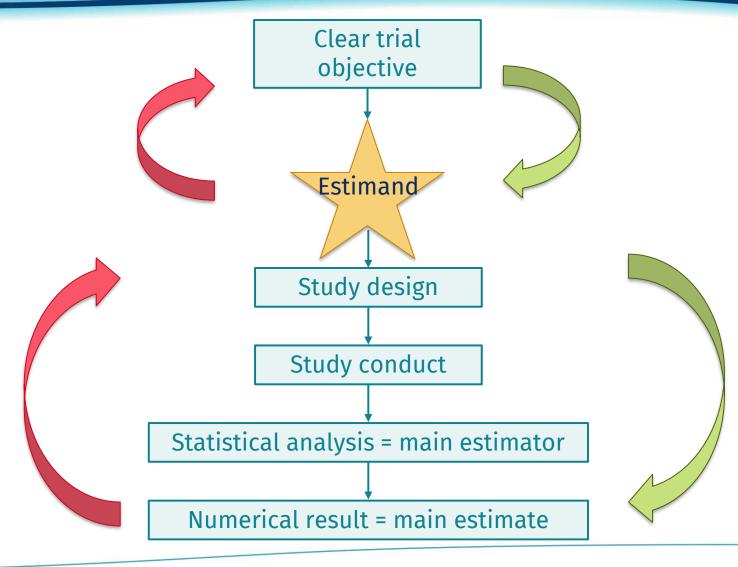
Estimate

Estimand



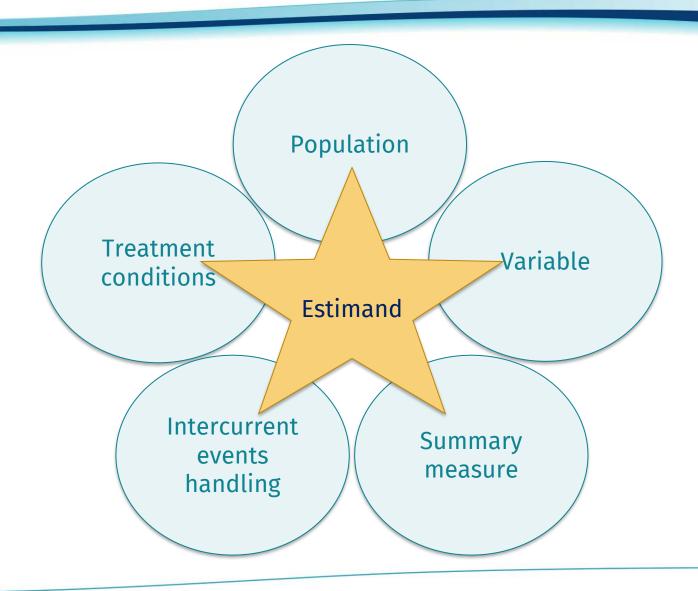
Where significant issues exist to derive a reliable estimate for a particular estimand, the trial objectives need to be reconsidered from top-down to main estimator (green arrows).

The main estimator should never define the trial objective from bottom up (red arrows).



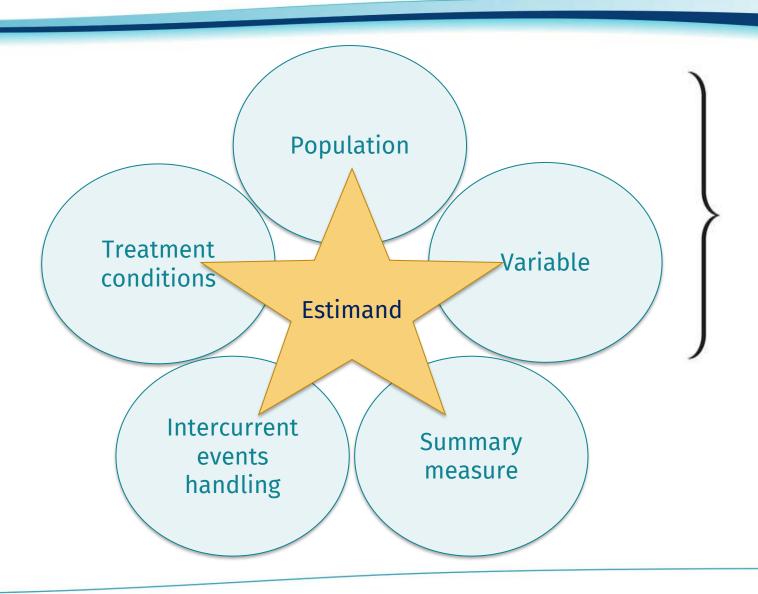
Estimands

ICH E9(R1)
recognised that a
description of an
estimand includes
5 attributes:



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Intercurrent
events may be
incorporated
into
treatment,
population
and/or
variable
attributes

- The **treatment condition(s)** are the treatment strategies you want to compare, for example:
 - Intervention A versus intervention B
 - Intervention A plus rescue medication versus intervention B plus rescue medication

Population

- The **population** of patients who you want to know the treatment effect for:
 - wider population i.e. not only the patients recruited into trial
 - not the analysis population!

Population

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 - not the analysis population!

- May be defined by inclusion/exclusion criteria in study protocol or,
 - further defined by a baseline characteristic
 - defined in terms of a *potential* intercurrent event (principal stratification), e.g., patients who would adhere to treatment

Variable

- The outcome variable/endpoint to be measured for each patient
- May include whether the patient experience an intercurrent event:
 - Composite (e.g. need for rescue or poor clinical outcome)
 - While-on-treatment re-defines time point (e.g. quality of life up to 6 months or last time point on treatment)

Primary estimand for severe chronic eczema trial

Objective: To compare a 12-week course of a new biologic against placebo in routine practice

IcEv1: Use of rescue medication

IcEv2: Treatment discontinuation

Objective: To compare a 12-week course of a new biologic against placebo in routine practice

IcEv1: Use of rescue medication

IcEv2: Treatment discontinuation

Estimand attribute	Description
Treatment	12 weeks of treatment with new biologic compared to placebo (150
condition(s)	mg e.o.w) regardless of any treatment discontinuation or use of
	rescue medication

Population

Estimand attribute	Description
Treatment condition(s)	12 weeks of treatment with new biologic compared to placebo (150 mg e.o.w) regardless of any treatment discontinuation or use of rescue medication
Population	Patients with confirmed diagnosis of severe chronic eczema meeting trial eligibility criteria

Variable

Estimand attribute	Description
Treatment condition(s)	12 weeks of treatment with new biologic compared to placebo (150 mg e.o.w) regardless of any treatment discontinuation or use of rescue medication
Population	Patients with confirmed diagnosis of severe chronic eczema meeting trial eligibility criteria
Variable (outcome)	Change in eczema severity as measured by the EASI score at week 12

Summary measure

Estimand attribute	Description	
Treatment condition(s)	12 weeks of treatment with new biologic compared to placebo (150 mg e.o.w) regardless of any treatment discontinuation or use of rescue medication	
Population	Patients with confirmed diagnosis of severe chronic eczema meeting trial eligibility criteria	
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Summary measure	Mean difference in outcome variable between treatment conditions	

Intercurrent events

Estimand attribute	Description	_
Treatment condition(s)	12 weeks of treatment with new biologic compared to placebo (150 mg e.o.w) regardless of any treatment discontinuation or use of rescue medication	ICEv1 & IcEv2
Population	Patients with confirmed diagnosis of severe chronic eczema meeting trial eligibility criteria	
Variable (outcome)	Change in eczema severity as measured by the EASI score at week 12	
Summary measure	Mean difference in outcome variable between treatment conditions	

What about IcEv 3 - Use of Topical therapies?

Treatment policy

Hypothetical



Composite



While-on-treatment/alive

Principal stratum





Imperial Clinical Trials Unit

Considerations for treatment policy strategy

- Targets the treatment effect **regardless of/despite** the occurrence of intercurrent event (Intercurrent event considered as part of the treatment)
- Unconcerned/indifferent to the occurrence of intercurrent events
- Patient outcomes after intercurrent event of interest
 - Option 1: the treatment effect **despite** use of topical therapies



Considerations for treatment policy strategy

• Cannot be used when values for the variable after the intercurrent event do not exist for all subjects, e.g. generally cannot be used to deal with death!



Considerations for hypothetical strategy

• The treatment effect in a hypothetical scenario is targeted,

- Option 2: the treatment effect if topical therapies were not available

Implicit or explicit predictions/imputations required for patients who experienced

the event



Considerations for hypothetical strategy

- Some hypothetical scenarios might not always be informative/reasonable
 - e.g. if patients remained on treatment despite toxicities??
- Consider the plausibility of hypothetical scenario & clearly specify



Considerations for composite strategy

- The occurrence of the intercurrent event is included in the outcome variable by assigning it to a particular value of the outcome variable
- Simple binary responder/non-responder composite may be constructed:

- Option 3: composite of no topical therapy and favourable clinical outcome (EASI-75)



Considerations for composite strategy

- May be an ordinal/categorical/numerical composite
 - less straight forward with numerical as requires assigning a particular value to an event
 - can assigning ranks to outcomes/intercurrent events (worse ranks) and analyse the ranks
- Complications if treatment has a different effect on components

Considerations for while-on-treatment strategy

 Response to treatment prior to the occurrence of the intercurrent event is of interest

 Option 4: assess EASI outcome at 12 week <u>or at last time point prior to use</u> of topical therapy

Considerations for while-on-treatment strategy

- Generally appropriate only when duration of treatment is not important;
 - because duration is truly not important or
 - because the rate of an event or outcome is constant



Considerations for while-on-treatment strategy

- Generally appropriate only when duration of treatment is not important;
 - because duration is truly not important or
 - because the rate of an event or outcome is constant.
- When used to handle death, i.e. looking at response to treatment prior to the prior to occurrence of death
 - termed 'while-alive'



Considerations for principal stratum strategy

- The treatment effect only in the **subgroup** of the **population whose** intercurrent event status would be identical, irrespective of treatment group is targeted.
 - Option 5:treatment effect for the set patients who would not use topical therapies regardless of arm



Considerations for principal stratum strategy

- Modifies the population attribute think about interpretation!
- Can identify the set who would not (or would) have the event in practice?



IcEv3 - Use of Topical therapies?

Objective: To compare a 12-week course of a new biologic against placebo in routine practice

Treatment policy strategy – regardless of topical therapy

Hypothetical strategy - if topical therapies not available



While-on-treatment strategy – prior to use of topical therapy







Principal stratum strategy - subgroup of population who would not use topical therapy



Intercurrent events

Objective: To compare a 12-week course of a new biologic against placebo in routine practice

Estimand attribute	Description
Treatment condition(s)	12 weeks of treatment with new biologic compared to placebo (150 mg e.o.w) regardless of any treatment discontinuation or use of rescue medication
Population	Patients with confirmed diagnosis of severe chronic eczema meeting trial eligibility criteria
Variable (outcome)	Change in eczema severity as measured by the EASI score at week 12
Summary measure	Mean difference in outcome variable between treatment conditions
Handling Intercurrent	IcEv1: Use of rescue medication – treatment policy (as part of treatment)
events	IcEv2: Study treatment discontinuation – treatment policy (as part of treatment)
	IcEv3: Use of other topical medication - treatment policy

Missing data

- Anticipate ~15% loss to follow-up in the eczema trial
- Missing data are <u>not</u> Intercurrent events

Missing data Data that would be meaningful for the analysis of a given estimand but were not collected. They should be distinguished from data that do not exist or data that are not considered meaningful because of an intercurrent event.

- Missing data are irrelevant to the construction of the estimand
- The handling of missing data should be addressed in the statistical methods "How"

Missing data

- Collect informative reasons for why data are missing to distinguish intercurrent events from missing data
- For example, "loss to follow-up" may more accurately be recorded as "treatment discontinuation due to lack of efficacy"
- Where intercurrent event occurs, handle via the strategy chosen to account for that intercurrent event and not as missing data

Impact on trial design and conduct

- Trial design follows the specification of the estimand of interest & should align
- Alignment with estimand for:
 - The type of trial (e.g., double-blind placebo-controlled parallel design)
 - Duration of subject participation (12 weeks)
 - Discontinuation criteria for individual subjects, subject withdrawal criteria
 - Medications permitted before and during the trial (rescue and topical therapies)
 - Procedures for monitoring subject compliance
 - Measurements of efficacy parameters

Impact on trial design and conduct

- · The estimand of interest should inform sample size calculation
- When referencing historical studies take account that might have reported estimated treatment effects or variability based on a different estimand
- The impact of the strategy to reflect intercurrent events is included in the effect size that is targeted and the expected variance (*Delta*² *guidance*, *Cook et al 2018*)

Estimand impact on data collection

- Eczema trial: Collect data post-treatment nonadherence and after use of rescue or any other topical therapies
- A composite strategy/while-on-treatment/principal stratum strategy would not require data collection after the intercurrent event
- For a hypothetical stratum strategy data after intercurrent is irrelevant
- Data collection should be appropriate to address all trial estimands where multiple are used

Impact on trial analysis – main estimation

- The analysis approach, the 'estimator' chosen to align with a given estimand
 - Eczema trial: linear mixed model for repeated measures fitting to all observed data
- This is our recipe to obtain an estimate of the estimand of interest





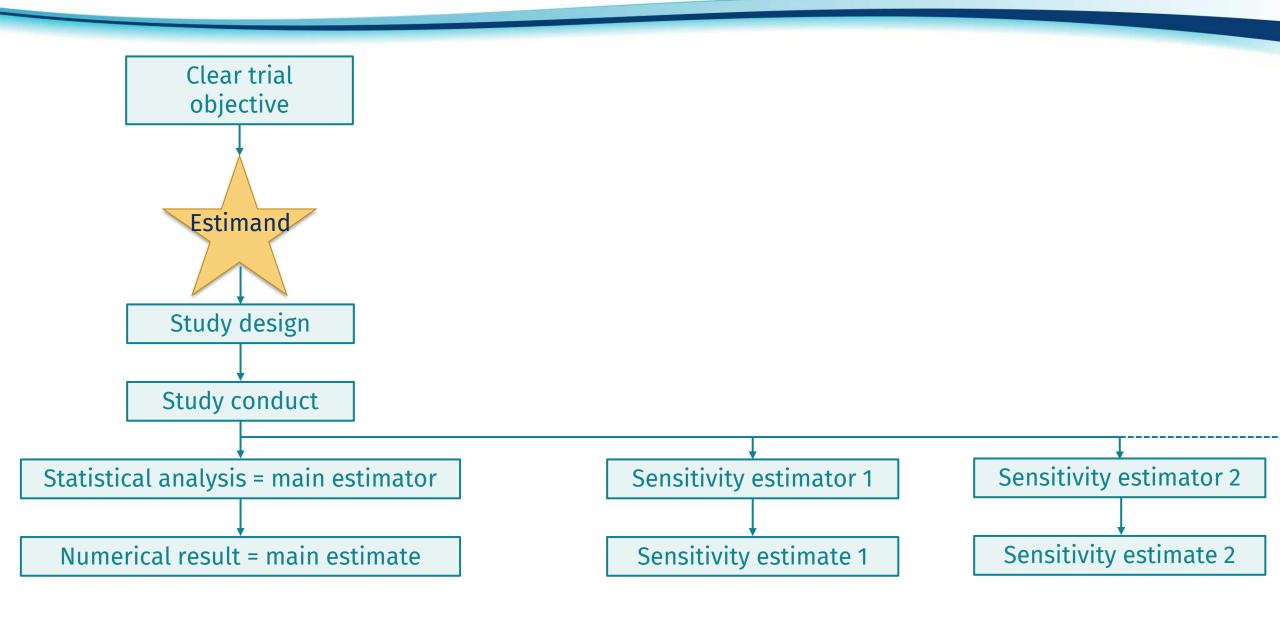
• The estimator selected should provide an estimate on which a reliable interpretation can be based

Sensitivity analysis

- Any assumptions made should be explicitly stated e.g. for missing data
- **Sensitivity analysis** should assess the robustness of results to the underlying assumptions

Sensitivity analysis: A series of analyses conducted with the intent to explore the robustness of inferences from the main estimator to deviations from its underlying modelling assumptions and limitations in the data.

Sensitivity analysis



Sensitivity analysis

- ICH E9(R1) recommends investigating the impact of changing one assumption at a time
- Particular attention should be given to missing data in sensitivity analysis
- The estimand of interest defines what data is missing
- It also prescribes how missing data should be handled in the analysis/sensitivity analysis

Supplementary analysis

• Other planned analysis which targets a different question

Supplementary analysis: A general description for analyses that are conducted in addition to the main and sensitivity analysis with the intent to provide additional insights into the understanding of the treatment effect.

Supplementary analysis

Objective: To assess whether a 12-week course of biologic would improve disease severity for all patients if rescue not available, otherwise as used in routine practice.

Estimand attribute	Description	
Population	Patients with confirmed diagnosis of severe chronic eczema meeting trial eligibility criteria	
Treatment condition(s)	12 weeks of treatment with new biologic compared to placebo despite any treatment discontinuation if rescue medication not available	
Variable (outcome)	Change in eczema severity as measured by the EASI score at week 12	
Strategies used to handle Intercurrent events	Use of other topical medication - treatment policy	
	Study treatment discontinuation – treatment policy (as part of treatment)	
	Use of rescue medication – hypothetical	
Summary measure	Mean difference in outcome variable between treatment conditions	

Objective: To demonstrate the efficacy of mRNA-1273 to prevent COVID-19



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Estimand Description

Vaccine efficacy will be measured using 1 – HR (mRNA-1273/Placebo) of COVID-19 from 14 days after second dose of IP in adults. A while alive strategy will be used for deaths unrelated to COVID-19, and a treatment policy strategy for early infection. A principal stratum strategy is used to exclude participants missing a dose of IP or being SARS-CoV-2 positive at baseline.



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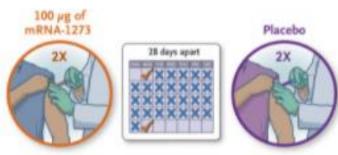
participants missing a dose of IP or being SARS-CoV-2 positive at baseline.

Target Population Adults aged 18 years and older in circumstances at a high risk of SARS-CoV-2 infection but without

medical conditions that pose additional risk of developing severe disease.

The population excludes those previously infected or vaccinated for SARS-CoV-2 or with a medical condition, on treatment that poses additional risks (including those requiring immunosuppressants or

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Variable/Endpoint	Time to COVID-19 Disease, censoring at early discontinuation, early infection, or last assessment for an event not being observed, whichever comes earlier.	



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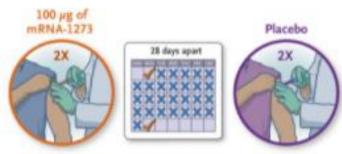
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Treatment Condition(s) Test: mRNA-1273

Reference: Placebo



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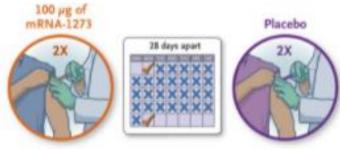
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Population-Level

Summary

Vaccine efficacy defined as 1 - HR of mRNA-1273/Placebo



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Population-Level

Summary

Vaccine efficacy defined as 1 - HR of mRNA-1273/Placebo

Intercurrent Event

Strategy

IcEv1 (unrelated death): While alive

IcEv2 (early infection): Treatment policy
IcEv3 (Missed dose of Principal stratum

IP):

IcEv4 (SARS-CoV-2 Principal stratum

Imp. positive at baseline):

mRNA-1273

100 µg of









Primary Objective

To establish whether minimally invasive cardiac output monitoring to guide protocolised administration of intra-venous fluid during and for up to six hours after major emergency bowel surgery leads to an increase in the number of days alive and out of hospital within 90 days of randomisation.



Primary Estimand

The estimand for the primary outcome (DAOH90) is the ratio of means of days alive and out of hospital within 90 days of randomisation between protocolised cardiac output-guided haemodynamic therapy vs. usual care (intravenous fluid administered without use of cardiac output monitoring), regardless of adherence or use of cardiac monitoring in the control arm, in participants aged ≥50 years who undergo emergency bowel surgery



Aspect	Definition	
Target population:	Patients ≥50 years old who undergo emergency bowel surgery	
Variable/endpoint:	Days Alive and Out of Hospital within 90 Days of Randomisation (DAOH90 = count	
	of days alive and out of hospital within 90 days of randomisation where DAOH90 =	
	0 if patient dies within 90 days and DAOH = 90 – (days in hospital within 90 days of	
	randomisation) if patient alive 90 days after randomisation)	
Treatment conditions:	Intervention Group - Protocolised cardiac output-guided haemodynamic therapy	
	during surgery, and for six hours after in patients admitted to an area capable of	
	delivering this intervention.	
	Usual Care Group - Intravenous fluid administration without the use of cardiac	
	output monitoring or protocol.	
Population level summary measure	Ratio of means (Intervention v usual care group).	



Aspect	Definition	
Intercurrent events	Strategy	
Surgery not received (applies to both treatment arms)	Principal stratum (of participants undergoing surgery)	
Procedure modified after surgery begins such that no	Treatment policy	
longer eligible for NELA (applies to both treatment arms)		
Receipt of cardiac output monitoring (control arm only)	Treatment policy	
Failure to initiate cardiac output monitoring during/after	Treatment policy	
surgery (intervention arm only)		
Cardiac output monitoring initiated but intervention	Treatment policy	
algorithm not followed		

ICH E9(R1) Summary

- Introduced the estimand framework to align trial objectives, design (data collection), conduct, analysis and inference
- At initial planning stages translate trial objective(s) into estimands
- Consider intercurrent events and strategies relevant for clinical context
- Subsequently align design, conduct and analysis with estimand(s)
- Missing data is not an intercurrent event estimation issue
- Conduct sensitivity analysis to explore the robustness of inferences to deviation from underlying assumptions (same estimand)
- Supplementary analysis are any other analysis conducted to fully investigate and understand the trial data (e.g. different estimand)